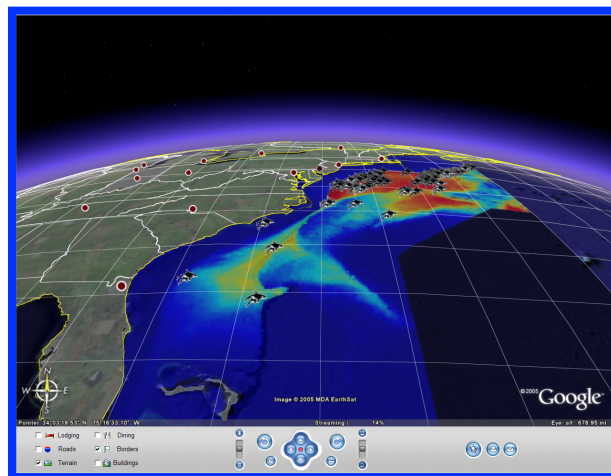




## **Phase I Discovery & Feasibility project NNX11AR56G :**

Evaluating user needs for models and decision tools to predict the impacts of climate change on the marine environment



PI Pat Halpin, Duke University

NASA Grant / Cooperative Agreement NNX11AR56G

*Marine Geospatial Ecology Lab, Nicholas School of the Environment, Duke University*



# Phase I Discovery & Feasibility project NNX11AR56G :

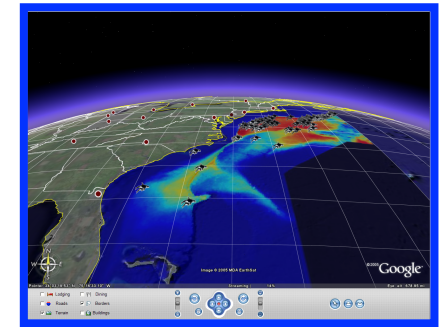
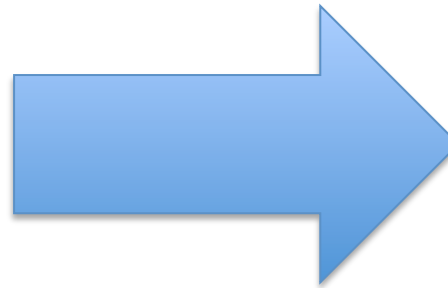
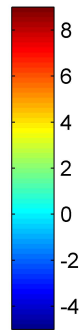
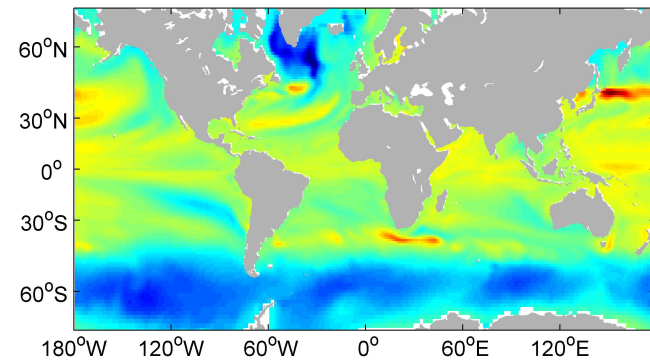
Evaluating user needs for models and decision tools to predict the impacts of climate change on the marine environment

**Goal:** explore the extension of marine animal forecasting DST to include long-term climate change capabilities:

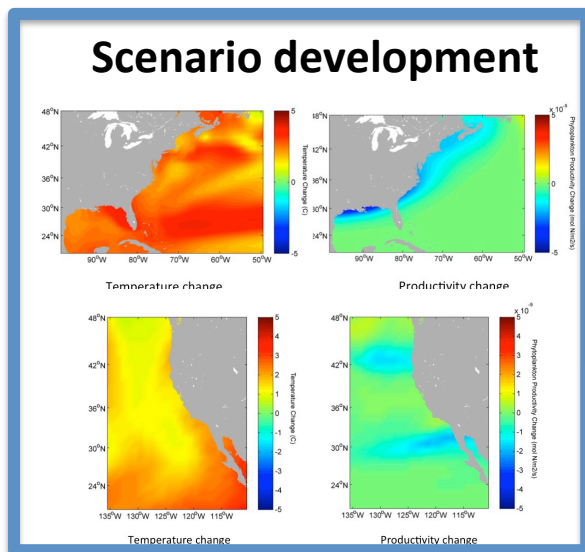
**GFDL TOPAZ model**

climate change capabilities:

**marine animal DST**



**ARL 0**



**ARL 1**

*interim progress*

**End-user webinars  
Workshop**

spring / summer 2013

**ARL 2.3 – 3.1**

**Feasibility report**

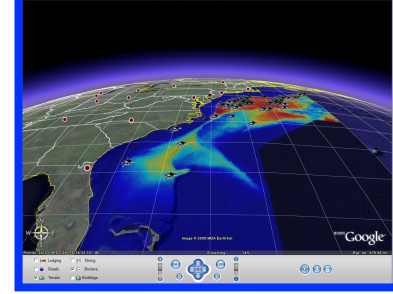
summer 2013



PI Pat Halpin, Duke University

# Outline:

- Protected species forecasting problem
- Past / ongoing forecasting efforts
- Inclusion of climate change scenarios
- User needs assessment
- Next steps



# Cetaceans (whales, dolphins and porpoises) and anthropogenic threats



## Threats include

Ship strikes  
Fishery bycatch  
Naval activities

Anthropogenic sound



## Cetaceans protected by US laws

MMPA

ESA

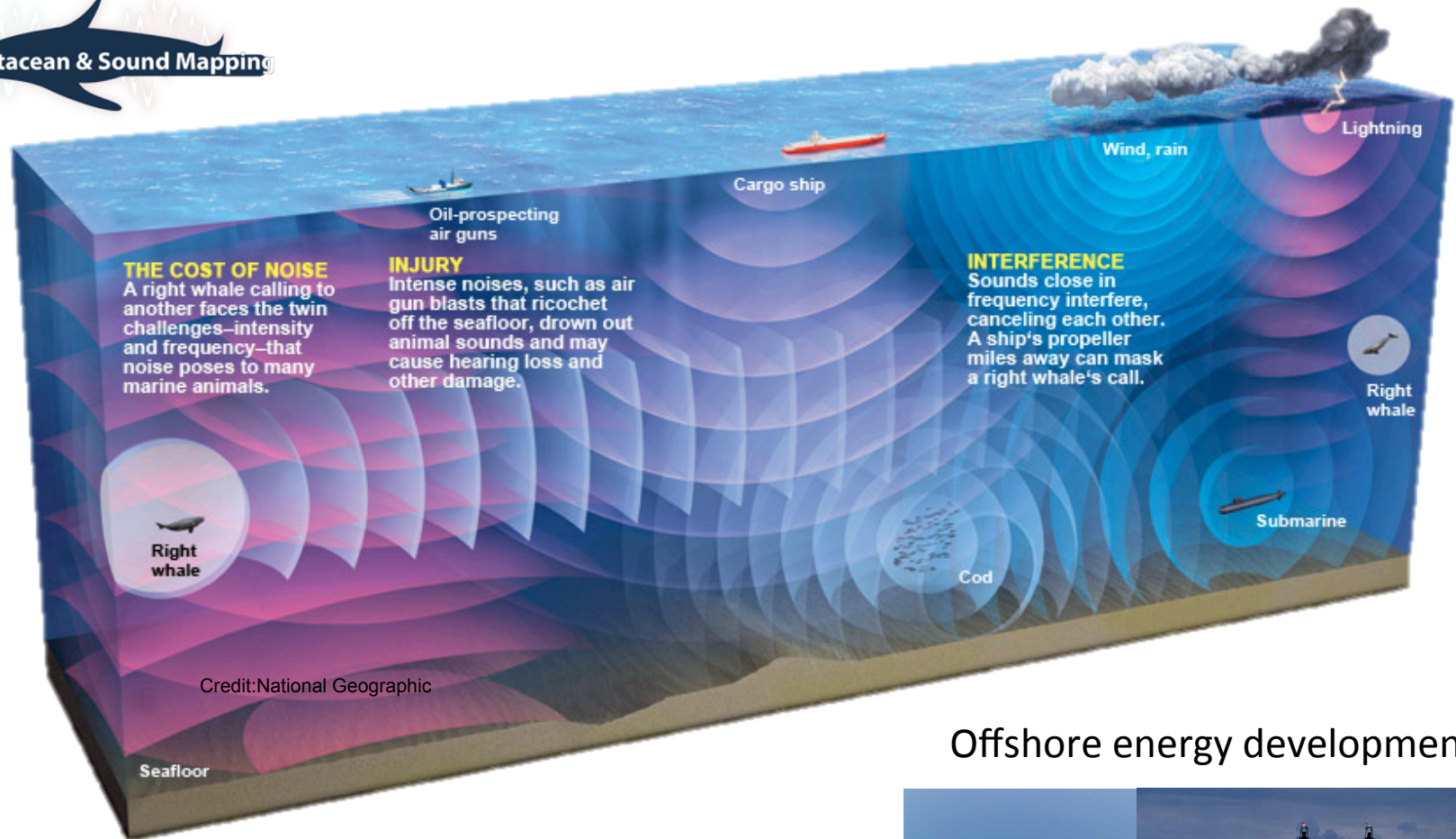




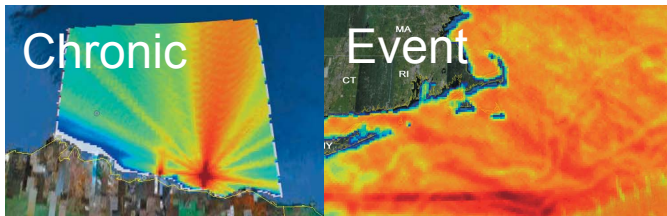
# A special focus on acoustic habitats



## Cetacean & Sound Mapping



## Offshore energy development



# Cetaceans (whales, dolphins and porpoises) and anthropogenic threats



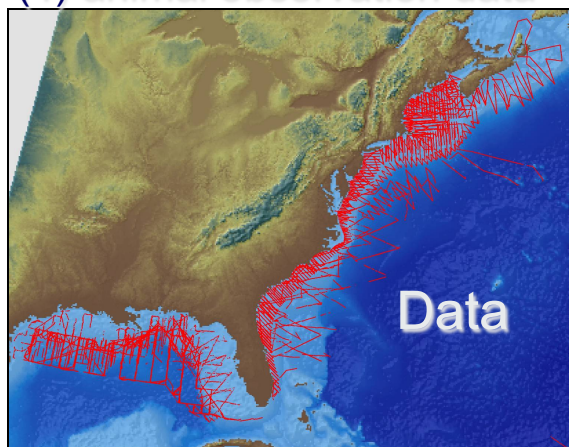
*What are the potential changes in oceanographic conditions, marine animal distributions and densities that will effect future management of protected species?*

*What are the data and forecasting needs of federal management agencies in the future?*

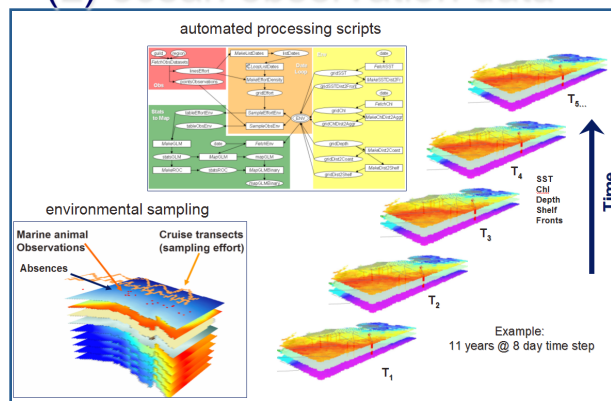


# Current Forecasting Process

## (1) animal observation data

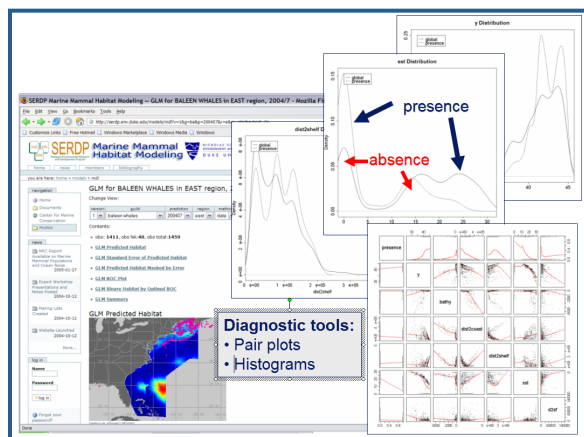


## (2) ocean observation data



Temporally  
matched  
covariates

GAM models of  
density  
&  
habitat



## (3) statistical analysis & modeling

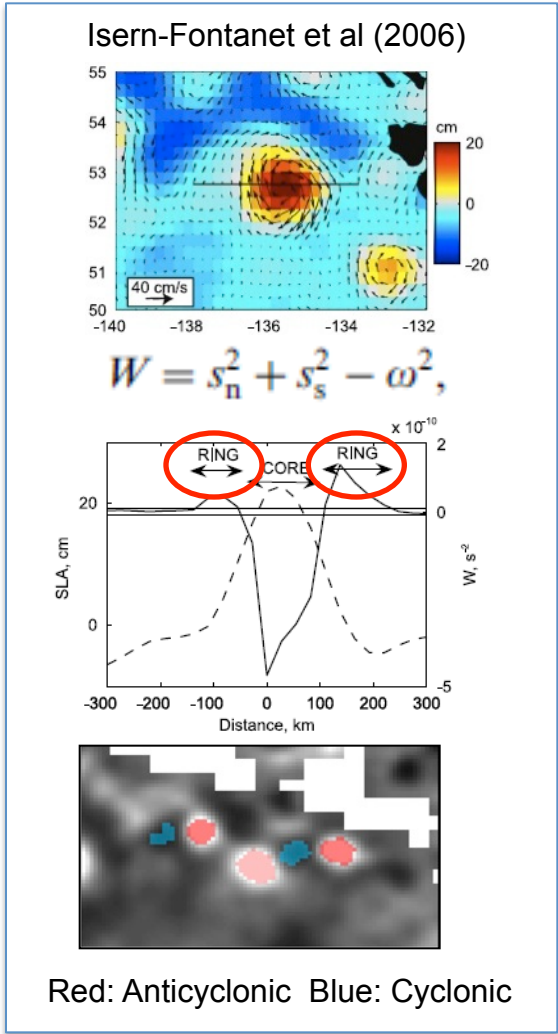
## (4) spatial decision support system



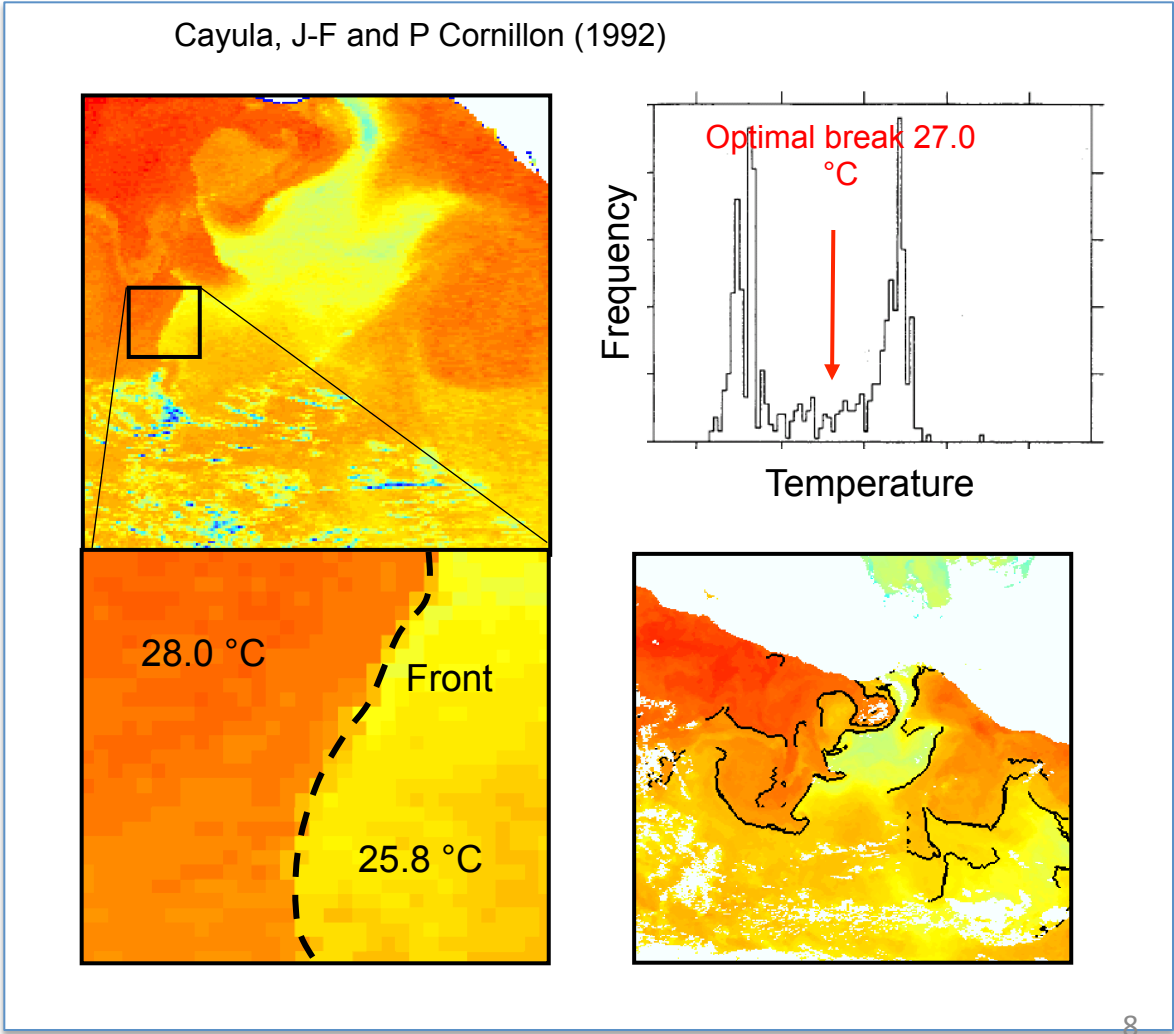


# Dynamic Variables from Satellites

## Eddies from AVISO

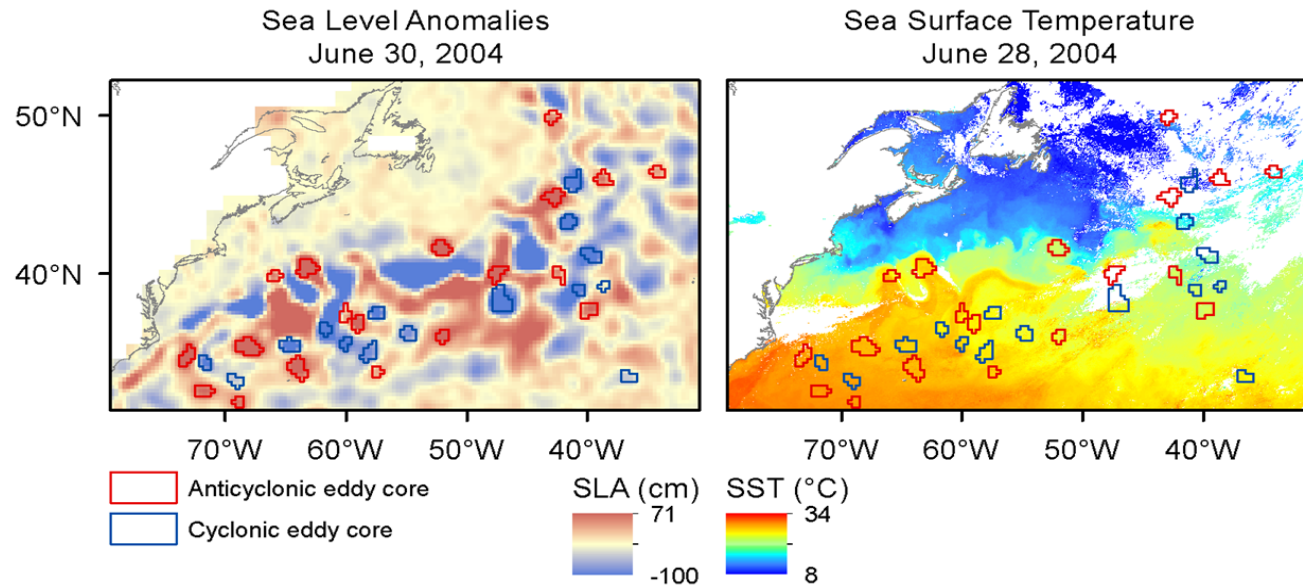


## Fronts from Pathfinder / GHRSSST



Previous NASA project NNX08AK73G goal: Upgrade DST to use more dynamic oceanographic covariates

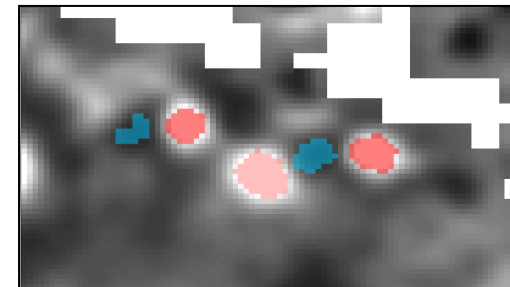
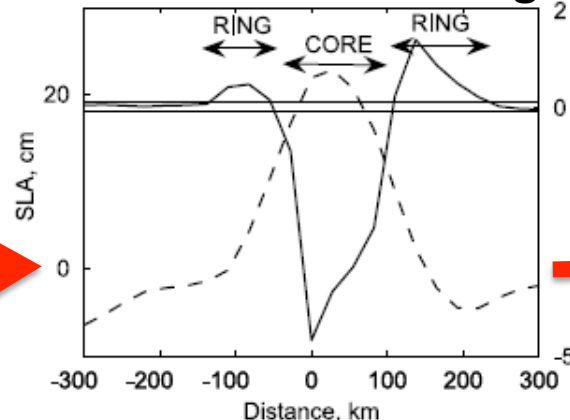
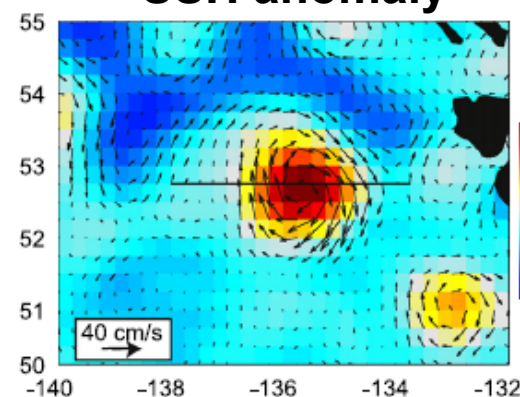
## Detecting sea height anomalies & eddies



### SSH anomaly

### Okubo-Weiss Detection algorithm

### Derived eddy features



Aviso DT-MSLA 27-Jan-1993

Red: Anticyclonic Blue: Cyclonic



## Species data providers

## Ocean data providers

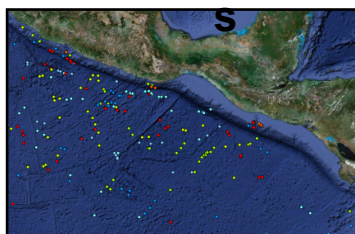
## Protected Species Decision Support System



NASA project  
NNX08AK73G



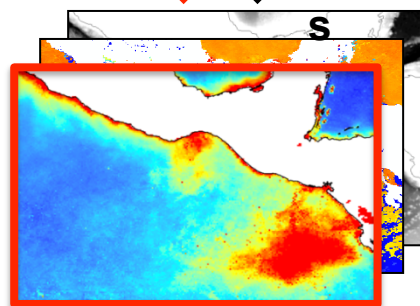
## Species observation



More



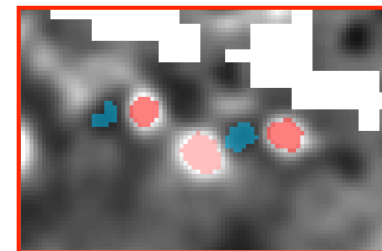
## Ocean observation



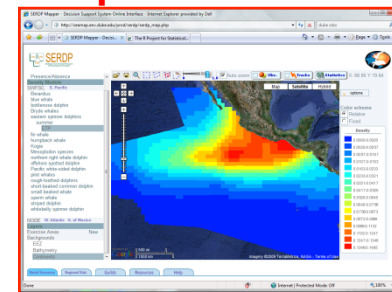
**NASA project  
enhancements**

## Algorithms

$$\begin{aligned} u &= -\frac{g}{f} \frac{\partial h}{\partial y}, & v &= \frac{g}{f} \frac{\partial h}{\partial x} \\ \omega &= \frac{\partial v}{\partial x} - \frac{\partial u}{\partial y}, & s_n &= \frac{\partial u}{\partial x} - \frac{\partial v}{\partial y}, & s_s &= \frac{\partial v}{\partial x} + \frac{\partial u}{\partial y} \\ W &= s_n^2 + s_s^2 - \omega^2, \end{aligned}$$



## Ecologically-important parameters



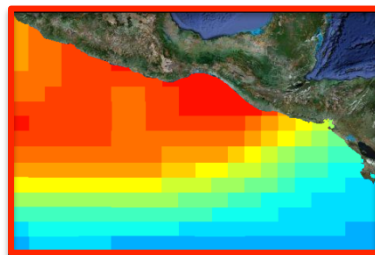
## Statistical models

$$\begin{aligned} g(\mu) &= \beta_0 + \beta_1 x_1 + \dots + \beta_m x_m \\ g(E(Y)) &= \beta_0 + f_1(x_1) + f_2(x_2) + \dots + f_m(x_m). \end{aligned}$$

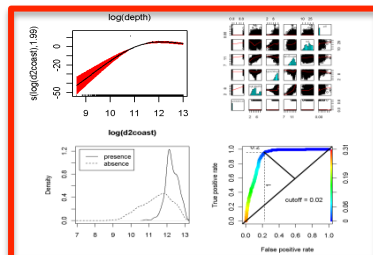


## GIS Tools

- Marine Geospatial Ecology Tools
  - Connectivity Analysis
  - Conversion
  - Data Management
  - Data Products
  - Oceanographic Analysis
  - Spatial Analysis
  - Statistics

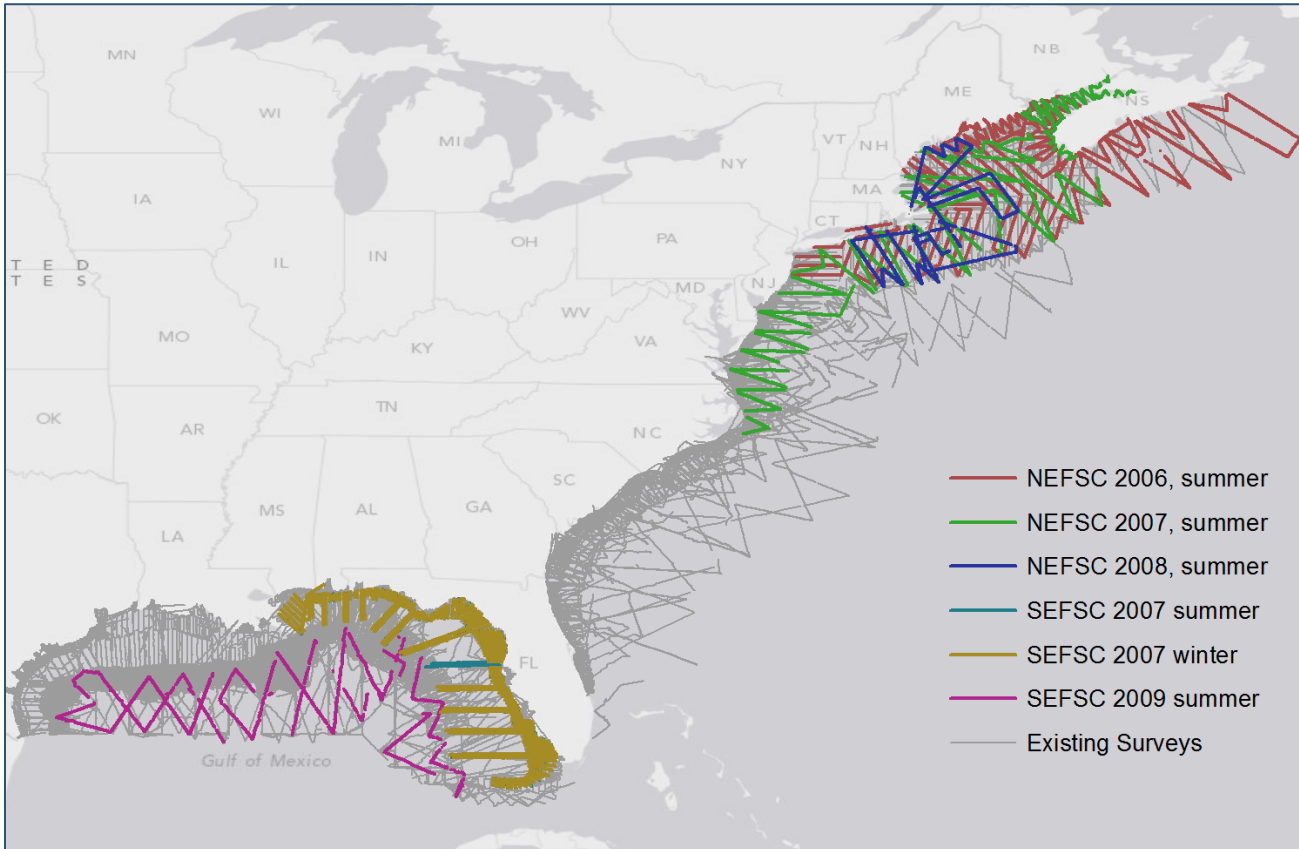


## Predicted distributions Summary plots



## SDSS website

# Ongoing updates of density models using new covariates



New Atlantic datasets  
now processed for  
producing updated  
cetacean density surface  
models.

## New covariates

- Time of year as a circular statistic
- Oceanographic model outputs, including mixed layer depth
- Dynamics: fronts, eddies, Lagrangian coherent structures, EKE,...

# North Atlantic Right Whale

Current population  
estimate

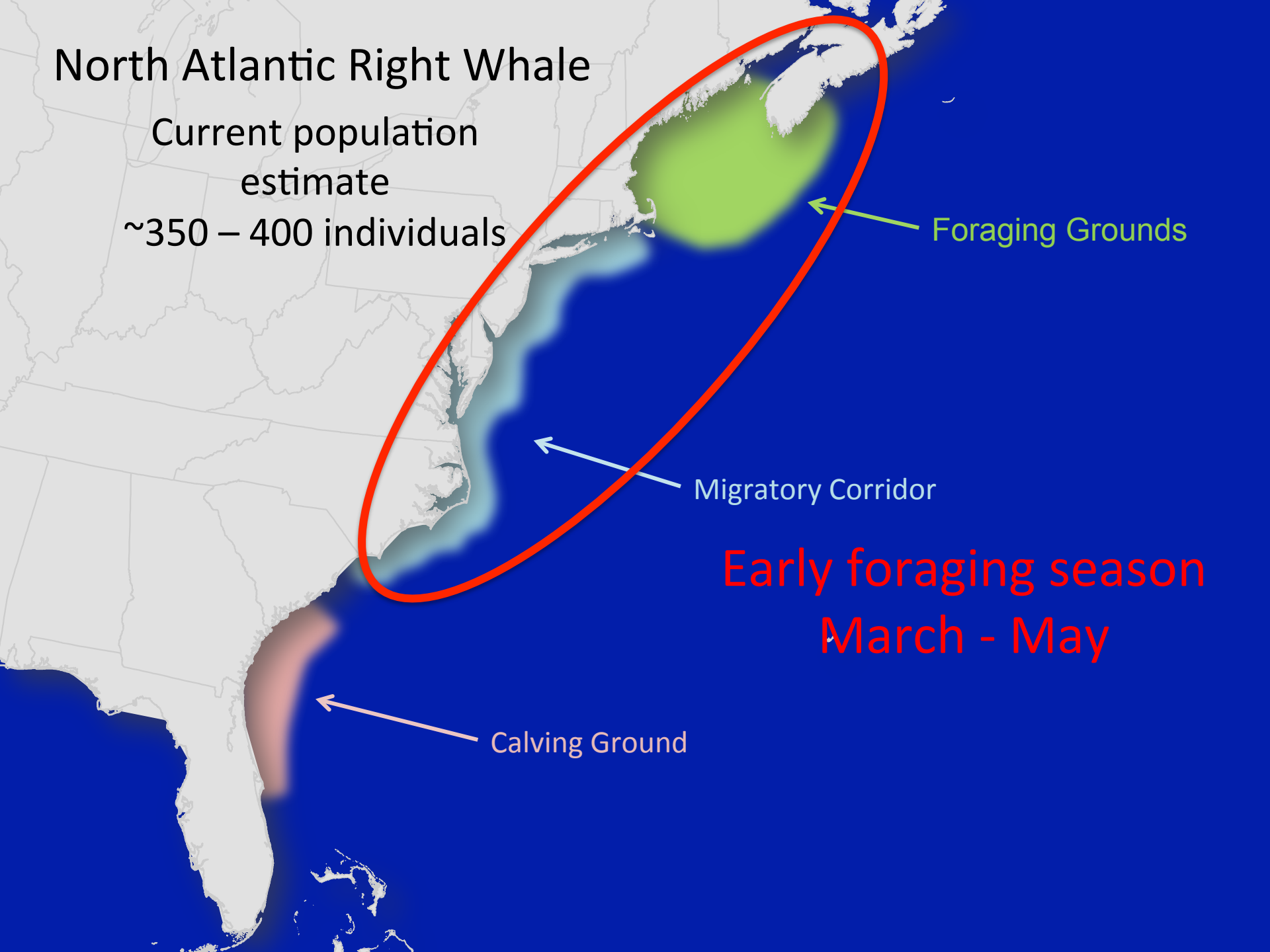
~350 – 400 individuals

Foraging Grounds

Migratory Corridor

Calving Ground

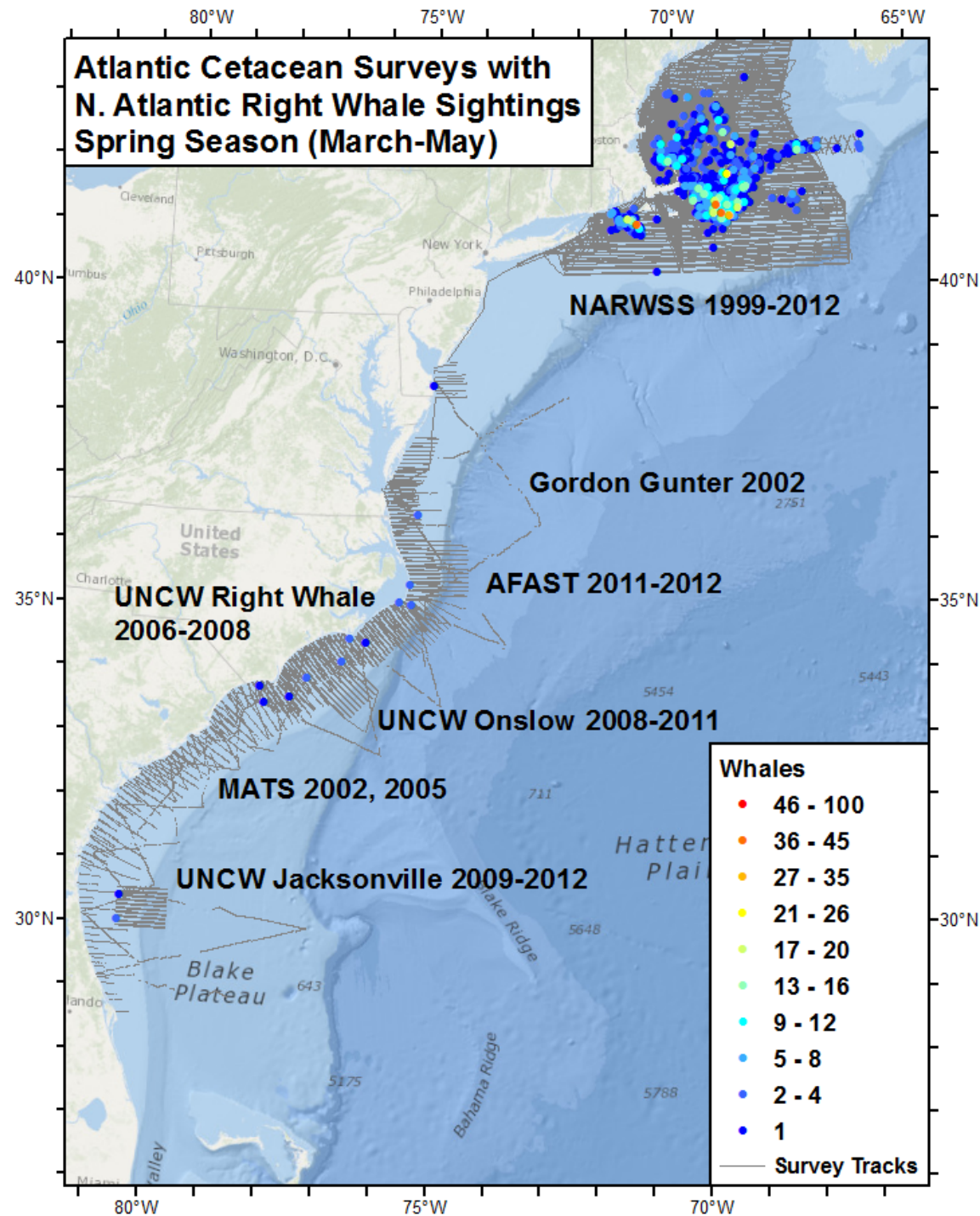
Early foraging season  
March - May



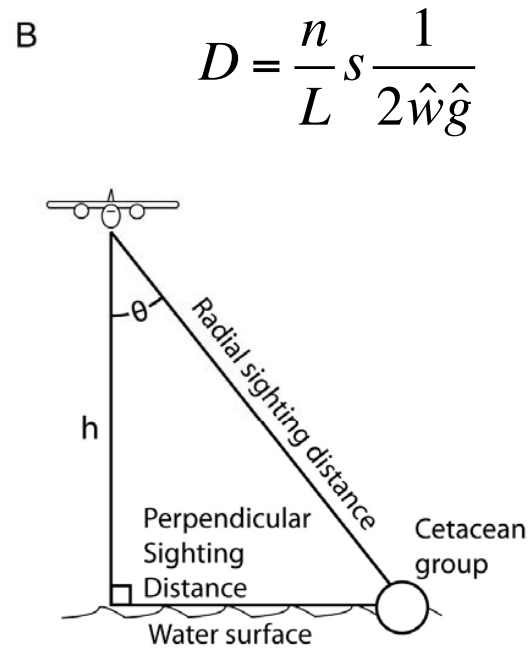
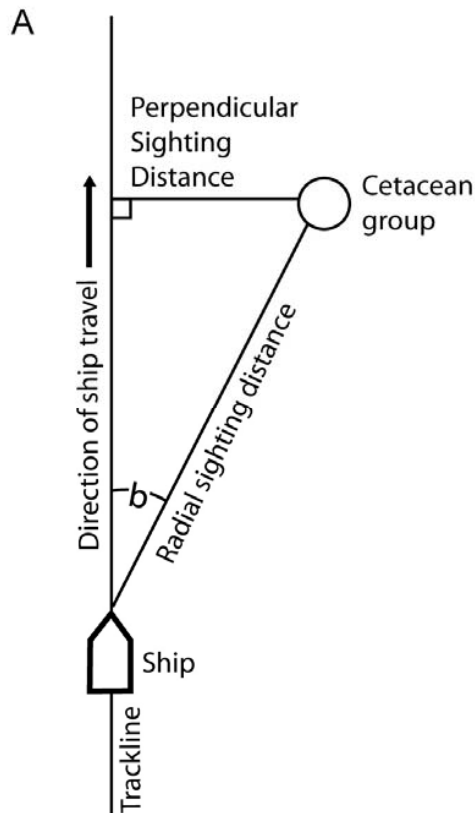
# Survey data

Survey records from 7 survey programs that operated between 1999-2012.

~287,000 km of linear distance surveyed during the focal spring season months of March-May



# Density Estimation



$$D = \frac{n}{L} s \frac{1}{2\hat{w}\hat{g}}$$

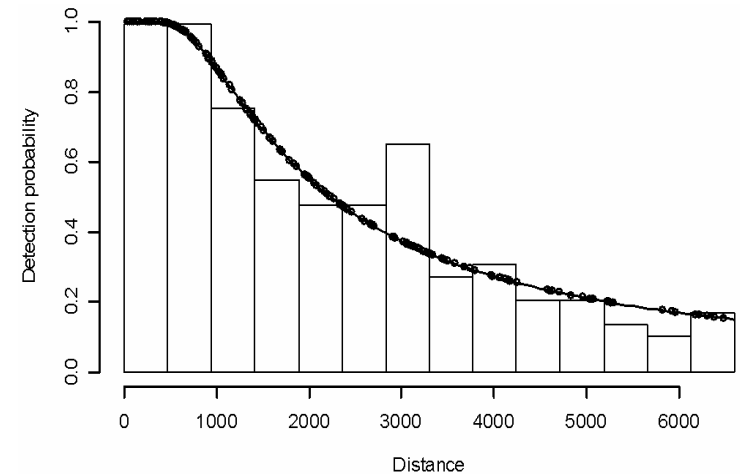
$n$ : encounters

$L$ : line length

$s$ : school size

$w$ : effective strip width,  $p(\text{distance})$

$g$ : probability of detecting on line,  $p(0)$

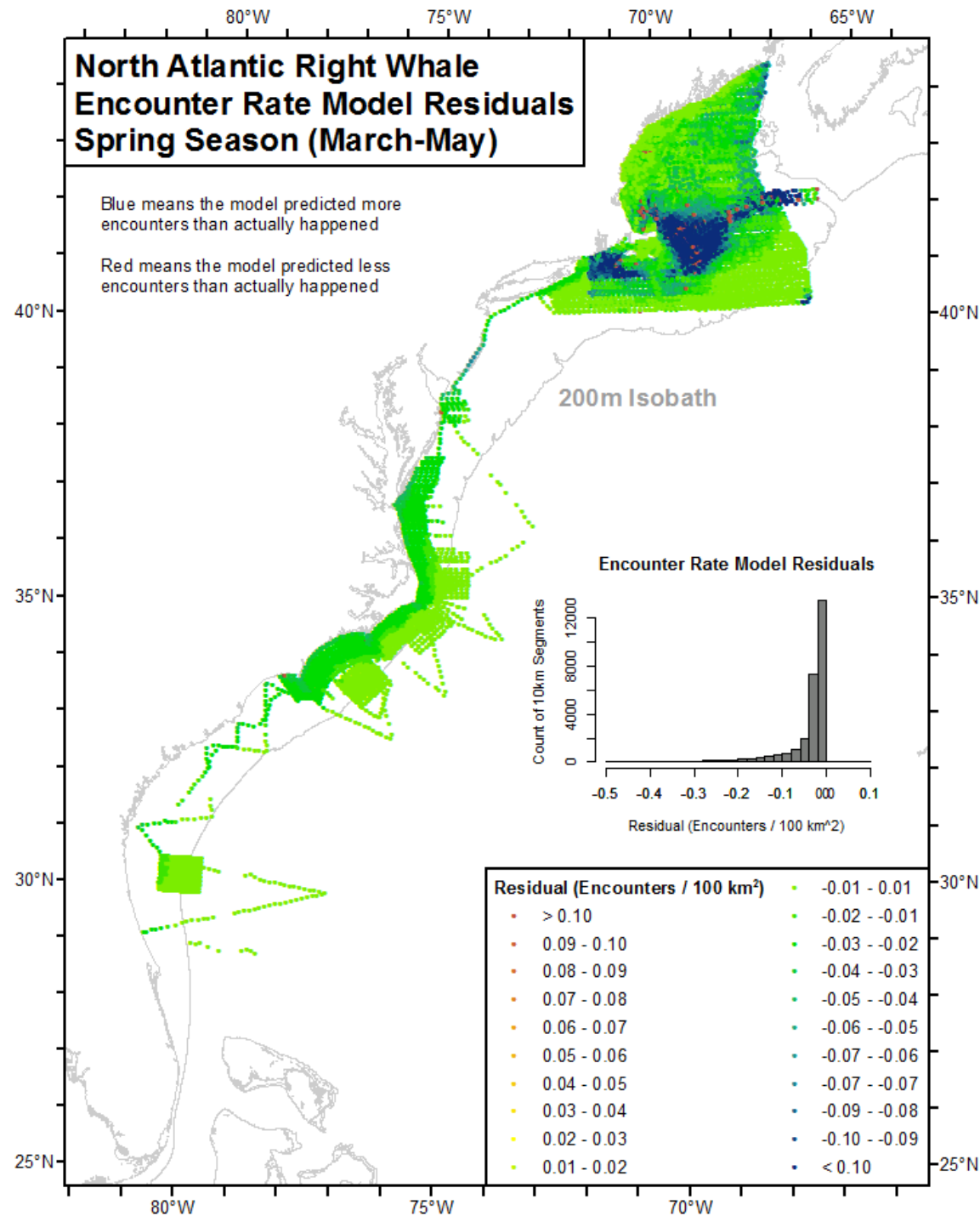




# Encounter rate model

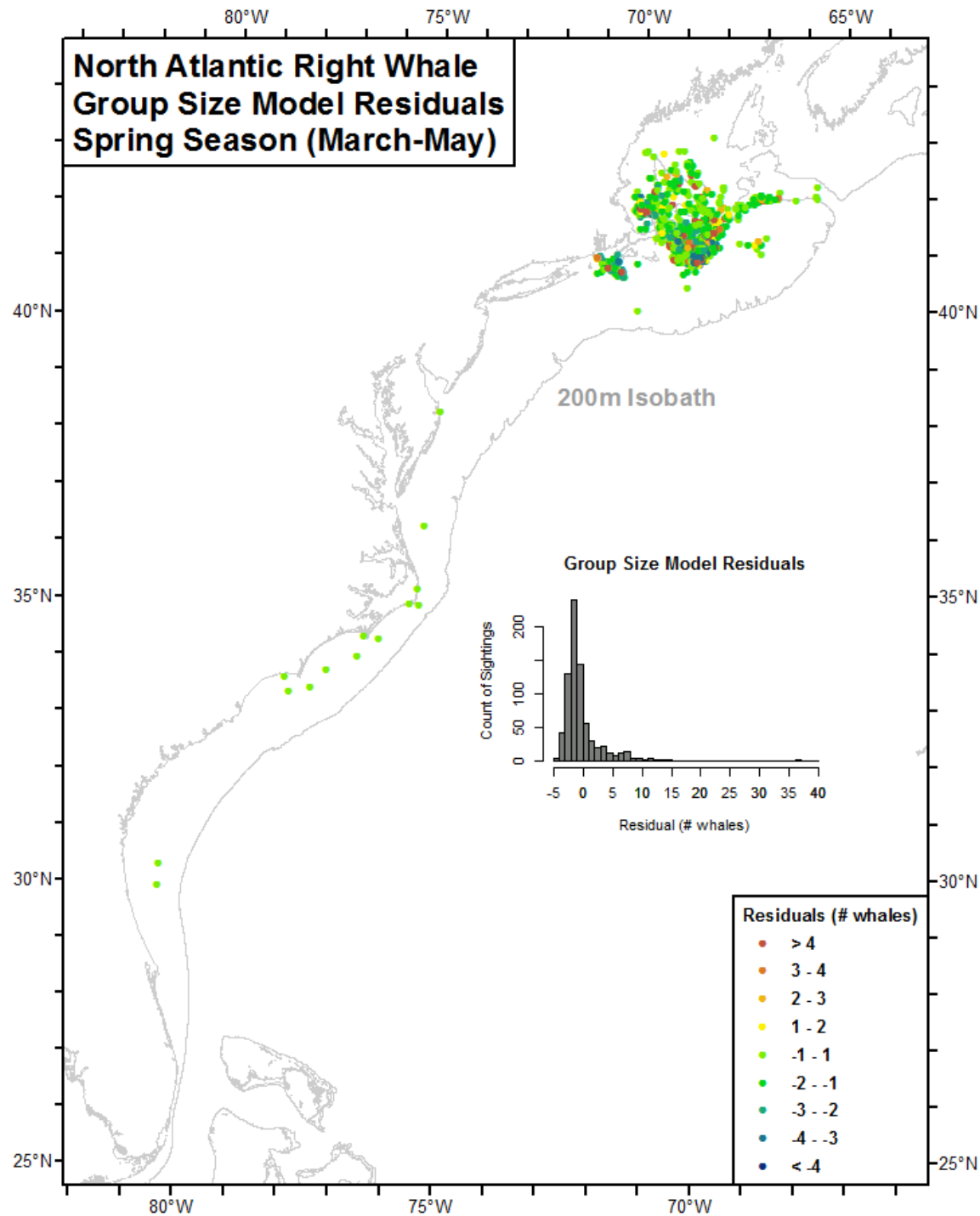
**Question:** how many animals are observed per sq km.

Must account for observer conditions and detection function.



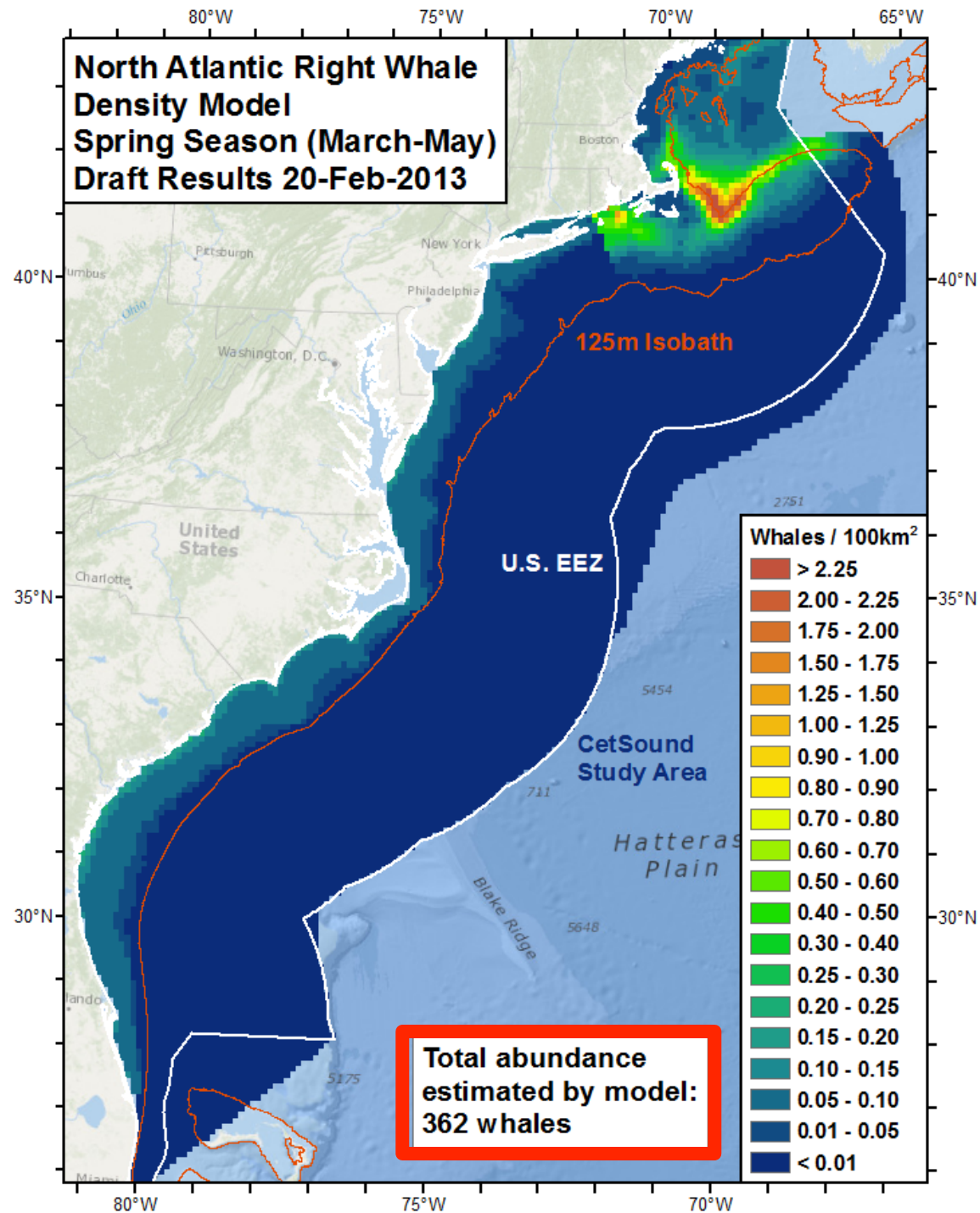
# Group-size model

**Question:** how many animals are observed in each group



# Density model

The total abundance of NARW is currently estimated to be 350 – 400 animals



# ***Predictor variables used in spatial models***

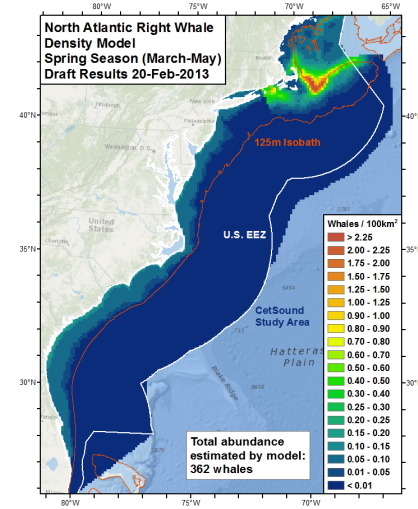
## **Static physiographic covariates:**

**Distance to shore**

**Bathymetric slope**

**Distance to closest 125m isobath**

**Distance to closest 300m isobath** greater than 250 km in length



## **Climatological oceanographic covariates**, computed on 8-day binning periods

NOAA NODC AVHRR Pathfinder 5.2 **SST**

UCSB GSM merged SeaWiFS/Aqua/MERIS **chlorophyll-a** concentration (Maritorena et al.)

**Total kinetic energy (TKE)** from AVISO DT-MADT Upd daily geostrophic currents

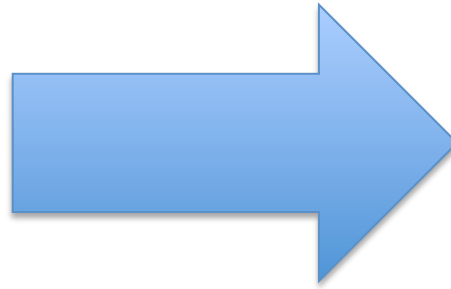
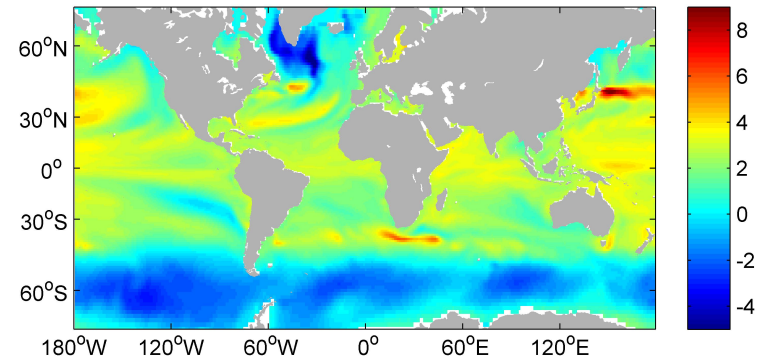
**Eddy kinetic energy (EKE)** from AVISO DT-MSLA Upd daily geostrophic currents

**Distance to closest 1 °C SST front**, computed in AVHRR Pathfinder SST using the Cayula-Cornillon (1992) algorithm implemented in the Marine Geospatial Ecology Tools software (Roberts et al. 2010)

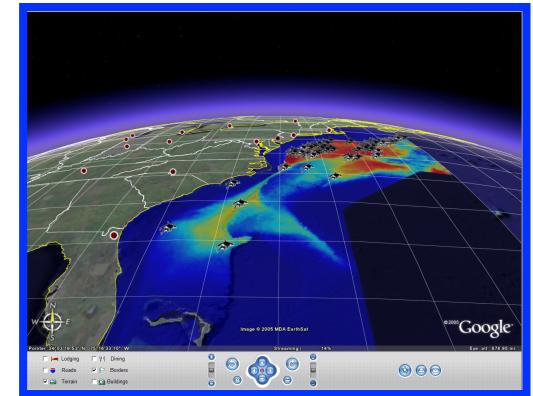
***Hypothesis: Dynamic oceanographic covariates better represent features that aggregate copepod prey...***

# *Future forecasting needs*

GFDL TOPAZ model



Cetacean SDSS



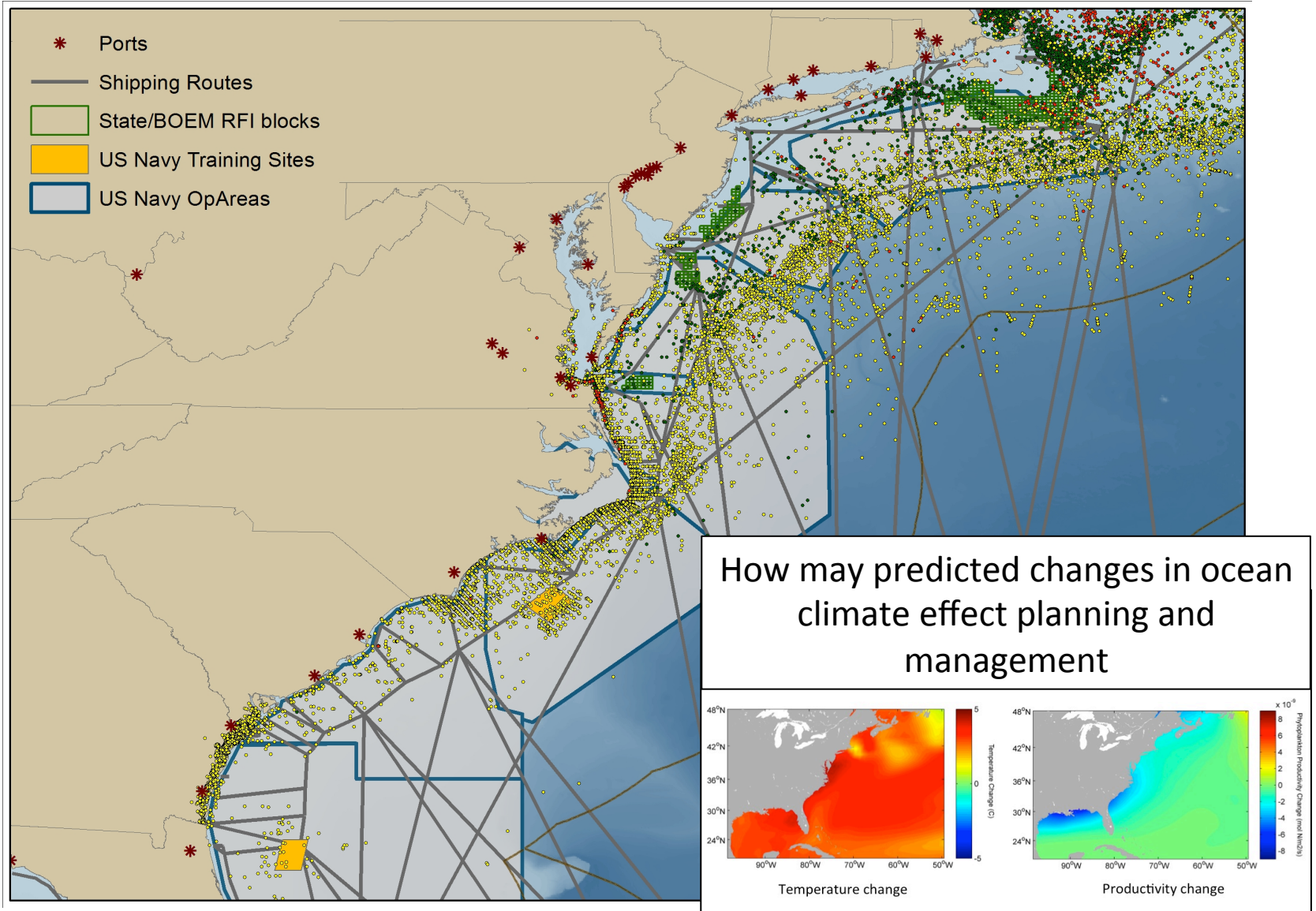
**Research question:** *What remote sensing and downscaling forecasting model products will federal agency users require for the management of migratory pelagic species under changing climates?*

**Approach:** A user needs evaluation for new models and decision support tools to forecast potential changes in marine environments and habitats under future climate change scenarios.

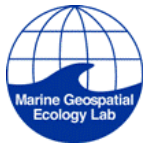
- Structured user needs questionnaires;
- A series of webinars and video meetings;
- An end-user workshop.



# Cetacean observations, navy training areas, shipping channels and renewable energy lease blocks



# *Future forecasting needs*



## ***The primary questions are:***

- how will responsible agencies and organizations use information on potential shifts in critical species habitats and densities;
- what types of forecasting information will be most useful to these users;
- what are the spatial, temporal and taxonomic resolutions required for long-term planning needs;
- how will end users use information on model forecast error and uncertainty;
- what data quality standards will end users require for forecast information.

# *Future forecasting needs*



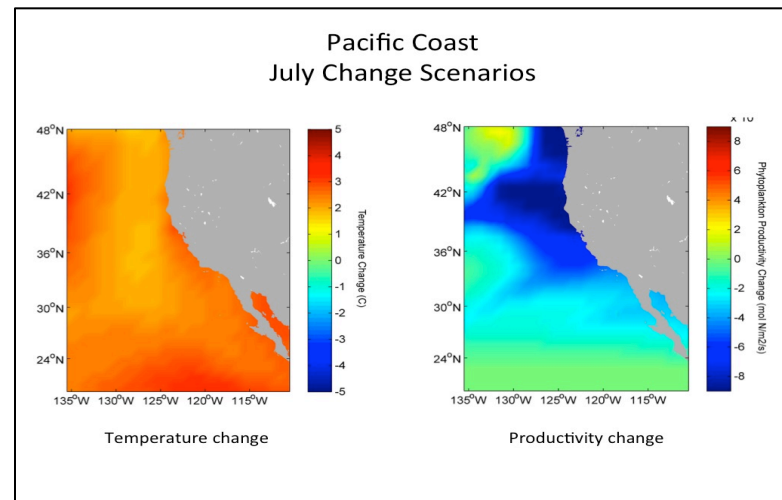
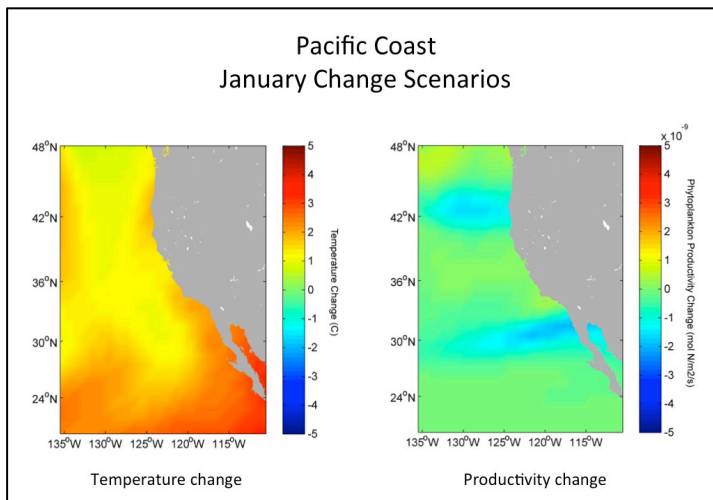
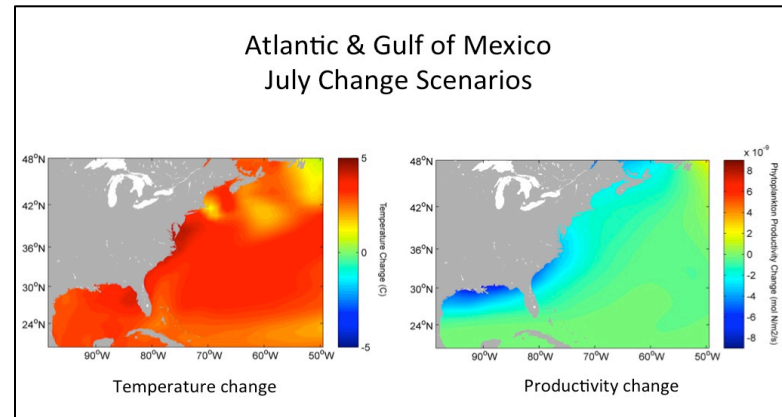
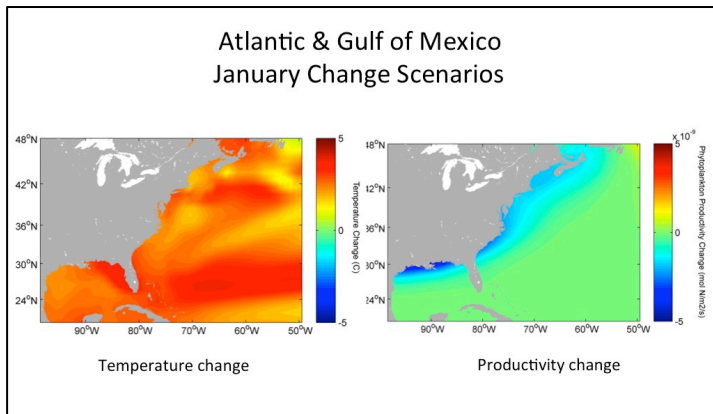
## ***Summary of work performed to date***

Our work to date has been in two areas:

- (1) We have been developing IPCC class oceanographic scenarios in preparation for our end-user engagement process; and
- (2) Webinar and workshop planning and preparation.

# *Future forecasting needs*

(1) IPCC class oceanographic scenarios in preparation for our end-user engagement process;



# Potential extension: fisheries ecology

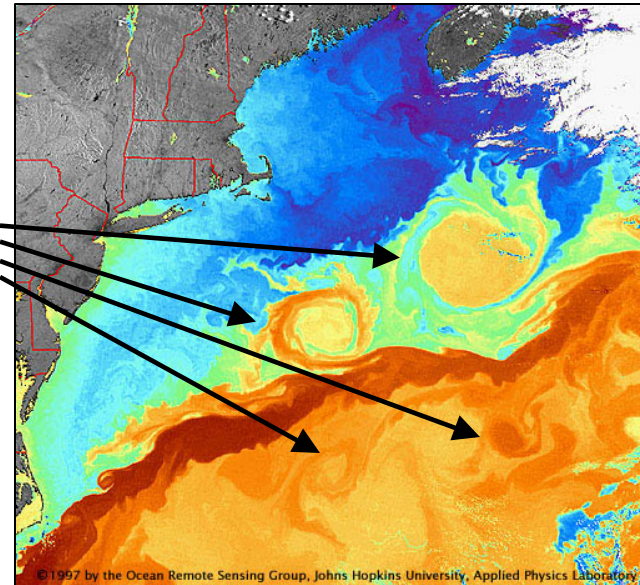
Example: Are tuna and swordfish catches in the northwest Atlantic correlated with eddies and how may these features change in the future?

*What are the forecasting needs of fisheries managers?*



PHOTO STEVE DROGMANN/THAMES

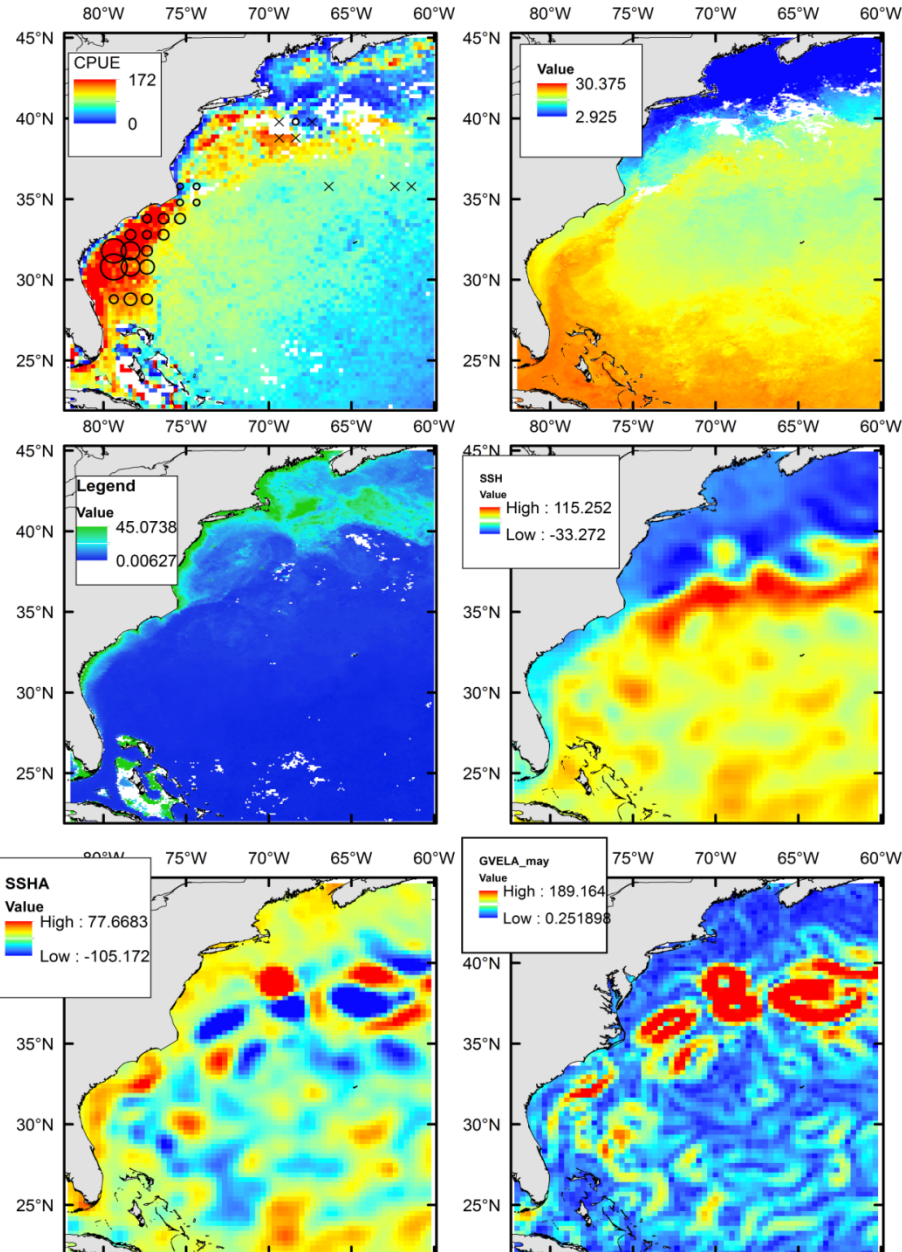
Eddies



Hsu, A, AM Boustany, JJ Roberts, and PN Halpin (submitted). Effects of mesoscale eddies on CPUE of four fish species in the western north Atlantic. *Fisheries Oceanography*.



# Potential extension: fisheries ecology



What fisheries are related to “fixed” features and which fisheries are related to climatological features?

*What are going to be the “sticky fish” under climate change scenarios...*

*Boustany, Dunn and Halpin 2013  
AAAS Symposium*

## *Future forecasting needs*

### (2) webinar and workshop planning and preparation.

We have also been conducting planning and materials for the webinars and user workshop to be conducted in spring / summer 2013.

We will provide background materials, scenarios and questionnaires to representative end users from NOAA, Navy, BOEM, USF&W, NASA and other agencies prior to deployment of the video webinar(s) and in-person workshop.



# Future forecasting needs

## (2) webinar and workshop planning and preparation.

The webinars are intended to be used to explore general user needs issues and scenarios prior to a workshop in order to better optimize the time spent for the in-person workshop session. Also: the webinars may be able to capture a broader audience of available participants.

*(**Note:** due to the increased risk that government agency participants may have additional travel and budget restrictions in spring 2013, we are developing contingency plans for an increased reliance on webinar interactions in lieu of in-person meetings if needed.)*

# Phase I Discovery & Feasibility project NNX11AR56G :

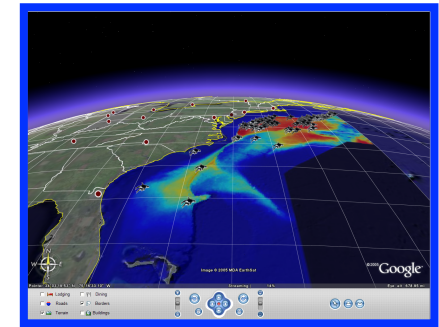
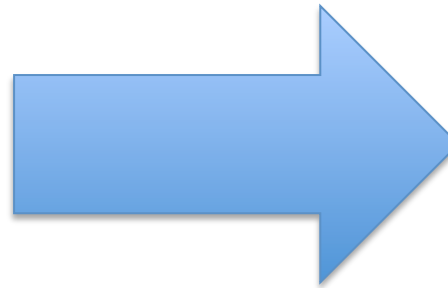
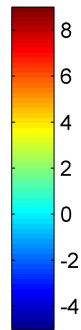
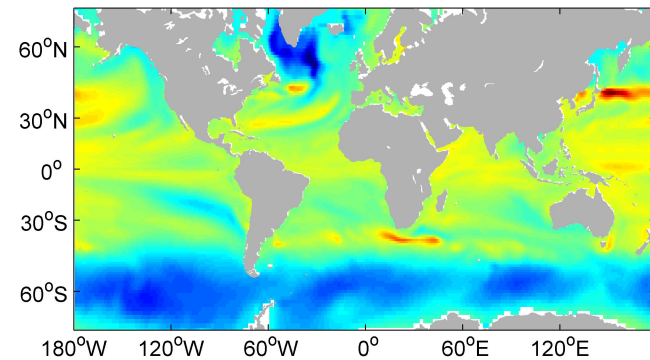
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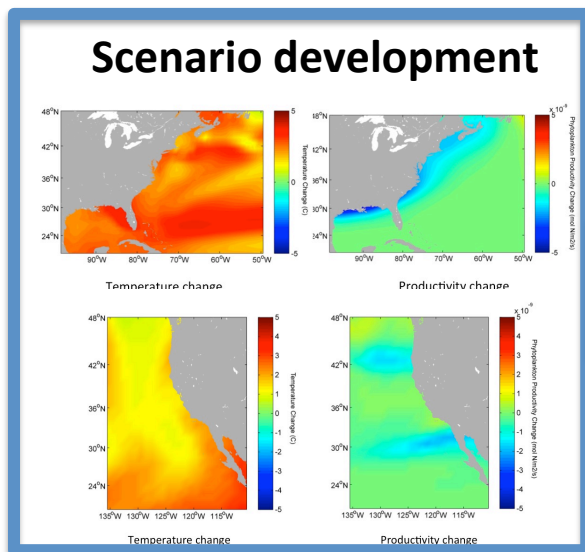
**GFDL TOPAZ model**

climate change capabilities:

**marine animal DST**



ARL 0



ARL 1

*interim progress*

ARL 2.3 – 3.1

End-user webinars  
Workshop

spring / summer 2013

Feasibility report

summer 2013



PI Pat Halpin, Duke University